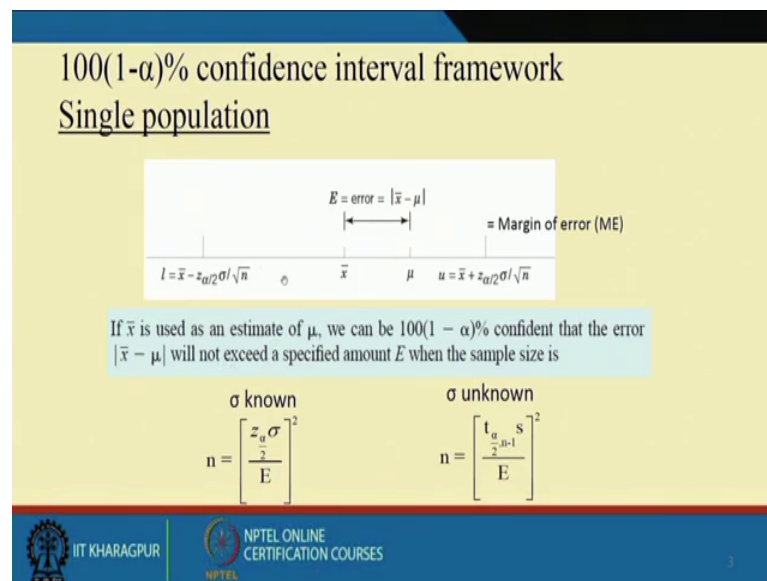


Design and Analysis of Experiments
Prof. Jhareswar Maiti
Department of Industrial and Systems Engineering
Indian Institute of Technology, Kharagpur

Lecture - 12
Determination of Sample Size

Welcome. In this lecture we will discuss; how to determine the sample size for an experimentation. It is a very important concept, because sample size plays in significant role in accomplish of the measures. We will cover this in 2 different lectures. In first lecture now, we will discuss with reference to single population mean test and difference between two population mean test. So, contains of presentation today. We will see that how the sample size can be calculated using confidence intervals framework and hypothesis testing framework.

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You see this figure. Here you just consider in normal population single population with min mu and standard deviations sigma.

Suppose you have conducted one sam you have collected one sample of size n. Now you are interested to know the confidence interval of mu from these sample calculations. So, x bar is the estimate of mu, and x bar is kept here. And then you have found out 100 into 1 minus alpha percent confidence which will be from between l to u. And we have seen earlier l equal to x bar minus z alpha by 2 sigma by root n and u is x bar plus z alpha by 2

sigma by root n. Now this plus minus sigma or sigma f z alpha by 2 sigma by root n means from x bar to u as well as from x bar to l this is known as margin of error.

Now, what we assume that the mu lies in between this interval with a confidence of 100 into 1 minus alpha percent. We do not know that what is the distance between x bar and mu, mu is somewhere. So, let us the permissible error is E which is x bar minus mu absolute value. Now we should calculate n in such a manner that, that these error lie within the margin of error.

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Determination of Sample Size (n).

$n = \text{Sample size}$

$ME = z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$ $E = \text{Acceptable error}$

$E \leq z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$

$\alpha = 0.05$
 $z_{\alpha/2} = 1.96$
 $\sigma = 10$

$E = |\bar{x} - \mu| = 2.98$

$n = \left(\frac{z_{\alpha/2} \sigma}{E} \right)^2 \cdot 100(1-\alpha)\%$

$n = \left(\frac{1.96 \times 10}{2.98} \right)^2 = (9.8)^2 \approx \underline{\underline{100}}$

$\alpha = \text{level of sig.}$

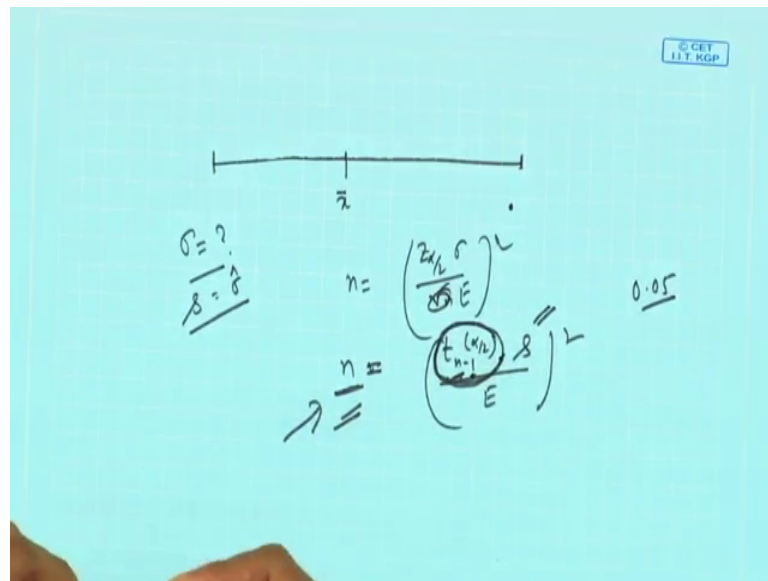
That means, the maximum error quantity will be ME. So, that is the concept. So, if I say then what is ME in this case, z alpha by 2 sigma by root n. You see sigma is the population standard deviation; it is fixed value you do not have n control on it. Now where you have control you have control on n. So, if we say that E which is the acceptable error equal to it will be maximum it will be less than equal to z alpha by 2 sigma by root n. And using this you can find out n equal to z alpha by 2 sigma by E whole square.

So, if you know sigma, if you then for a particular confidence interval for a par particular confidence interval means 100 into 1 minus alpha percent, or for a particular level of significance alpha, you will be avail to compute n; provided you know the E. Suppose let alpha equal to 0.05, then z alpha by 2 will be 1.96. And let us sigma equal to 10, and suppose E the accept equal to that x bar minus mu, this will acceptable one is this is 2.

So, then what will be n? N will be 1.96 into 10 divided by 2 square. That mean this is 9.98, but and this into 10. So, 9.8 square; so this will be if I say that this is around 10, and it is almost 100. So, this is the way you calculate sample size.

Now, sometimes what happened in this confidence interval approach, you will you do not know what is the sigma value.

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In that case you use s as the estimate of sigma, and then what you require you cannot use (Refer Time: 06:28) this z distribution, you will be using t distribution. And then n instead of z alpha by 2 sigma by root n sigma by E square it will be n will be t n minus 1 alpha by 2 into s by E whole square, where s is the sample standard deviation. So, essentially if even if you say alpha equal to 0.05, then depending on this n suppose you choose a particular n t s degrees of freedom will be difference. Second n like this you will get (Refer Time: 07:16) will be difference. So, you have to find out that n which ultimately satisfy the satisfy the condition, then it will be

So, as t is t n minus 1, this quantity again dependent on n. So, the formula what is written as n equal to t alpha by 2 n minus 1 s square by E; this will only give you for a particular n what is this? You choose n then t alpha by 2 n s by E, but you have to go for trial and error method.

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Two population means

$n_1 = n_2 = n; \sigma_1 = \sigma_2 = \sigma$
 $\hat{\sigma} = S_p$

ME is $t_{\alpha/2, 2n-2} S_p \sqrt{\frac{2}{n}}$

which depends on S_p and n .
 We have no control on S_p ; so ME will be controlled by choosing appropriate sample size n .

Notice that the curve descends rapidly as n increases up to about $n=10$ and less rapidly beyond that.

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This is what we have shown here for t distribution. Here instead of single population, we are use two populations. And our test is or we are interested in the confidence interval for the difference between two population means like μ_1 minus μ_2 .

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$\mu_1 - \mu_2$

$\bar{y}_1 - \bar{y}_2 \pm t_{\alpha/2, 2n-2} S_p \sqrt{\frac{1}{n_1} + \frac{1}{n_2}}$ $n_1 = n_2 = n$

$t_{2(n-1)} S_p \sqrt{\frac{2}{n}}$ RV: $(\bar{y}_1 - \bar{y}_2)$

$t_{Sp} \left(\frac{2}{n} \right)$

n

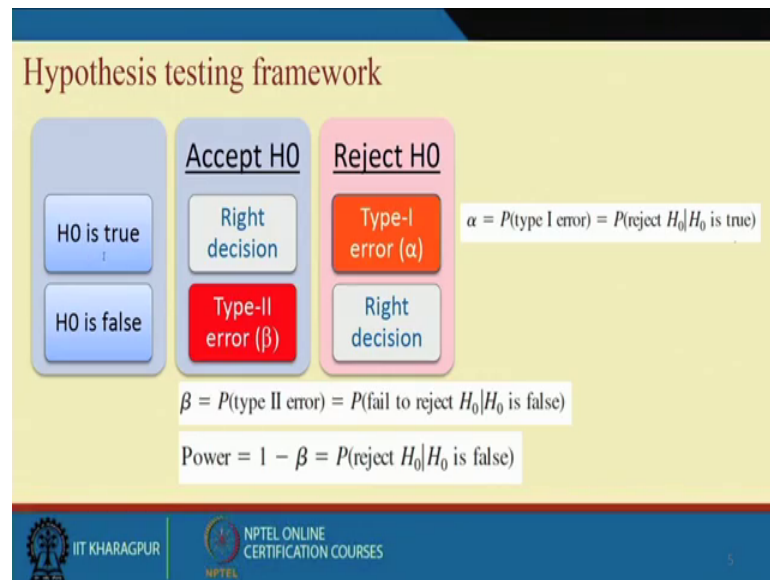
So, μ_1 is the population for the population mean for the characteristics y . And this is for first population this is for second population. And this will be the difference. So, we want to know the difference between two population means, whether they are different or not. So, we suppose you want the confidence interval for this. Then you all know you

have seen earlier this will be nothing but $\bar{y}_1 - \bar{y}_2$, minus we can write t_{n-1} plus $\frac{2 \alpha}{\sqrt{2}}$, and then root over $\frac{1}{n_1} + \frac{1}{n_2}$ and s_p will be there. So, this is plus minus this is the interval.

Now, if n_1 equal to n_2 , equal to n , then this quantity become t_{2n-1} alpha by $\frac{2 \alpha}{\sqrt{2}}$ plus s_p root over $\frac{2}{n}$. So, here what happened? You see that what is the countable? s_p is uncountable for you because this is the sample pulled variance. So, we have n which can be controlled. So, this n , now if we plot; that is, t square root of $\frac{2}{n}$ and this side n will get a curve. The curve will be something like this for this shown here. You see we have we have plotted this versus this. And ultimately you see that with n increases, this quantity decreases, and at around 10 or 11 after that there is not much decrease. So, you can assume that the $n \geq 10$ is a good sample size.

So, notice that the curve descends rapidly as n increase up to about 10 and less rapidly beyond that. So, you can say n equal to 10 is a reasonable good sample size; so this is what is our confidence interval approach. So, first I have giving you for single population and for two population main differences. If it is if the random variable $\bar{y}_1 - \bar{y}_2$ this called this giving situation, it follows normal distribution. It is easier, or if it follows t distribution, then you have to choose n . Then the degrees are using that corresponding degrees of freedom find out the t values. So, you require iterative method whether that is single population or two population case. And then you find out that n you consider that n which gives you the less t square root of $\frac{2}{n}$.

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Now, we will discuss another approach called hypothesis testing approach. What you do in hypothesis testing? You assume some null hypothesis and alternate hypothesis, and under null hypothesis you test using appropriate statistic and statistical and sampling distribution. And then you reject the null hypothesis depending on the test result or you failed to reject the null hypothesis. As a result, what happens? There will be reverse 2 are favourable and 2 are unfavourable by unfavourable. What I mean to say that they we commits certain errors and that is what is the decision framework for hypothesis testing.

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$$\Rightarrow \begin{cases} H_0: \mu = \mu_0 \\ H_1: \mu \neq \mu_0 \end{cases}$$

$$z_0 = \frac{\bar{X} - \mu_0}{\sigma/\sqrt{n}}, \quad z_0 = \frac{\bar{Y} - \mu_0}{\sigma/\sqrt{n}}$$

$$\begin{aligned} E(z_0) &= E\left(\frac{\bar{X} - \mu_0}{\sigma/\sqrt{n}}\right) = 0 \\ &= E\left(\frac{\bar{X} - \mu + \mu - \mu_0}{\sigma/\sqrt{n}}\right) = E\left(\frac{\bar{X} - \mu + \delta}{\sigma/\sqrt{n}}\right) = E\left(\frac{\delta}{\sigma/\sqrt{n}}\right) = \frac{\delta\sqrt{n}}{\sigma} \end{aligned}$$

$$E\left(\frac{\bar{Y} - \mu_0}{\sigma/\sqrt{n}}\right) = 0, \quad \frac{\delta\sqrt{n}}{\sigma}$$

$$\begin{aligned} \mu &= \mu_0 \\ \mu &= \mu_0 + \delta \\ \mu_0 &= \mu - \delta \end{aligned}$$

Now, you see the suppose H_0 for let it be a single population. H_0 we are saying μ equal to μ_0 and H_1 we are saying μ not equal to μ_0 . So, this is what you have already you seen earlier. Now the situation may be H_0 is actually true and H_0 actually false. But you would test may accept a false H_0 or may reject a correct H_0 . So, that is the situation here. If H_0 is true and your test accepted that it right decision, if H_0 is false test accepted it is again right decision. But if H_0 is true and you are rejecting null H_0 , then it is an error for type one error which probability is α . So, α is probability of committing type one error that mean probability reject H_0 , H_0 is true.

Similarly, another one H_0 is false, but you are accepting it this is known as B type 2 error and β is the probability of type 2 error β equal to probability fail to reject H_0 given H_0 is false. Now this is very interesting one and very important one also. Because if you accept H_0 when it is false, and when then you take many decisions which ultimately leads to very erroneous decisions which will be very costly also. So, another concept we will use here is power. What is power? Power is the $1 - \beta$. This is this is nothing but probability of rejecting H_0 , when H_0 is false.

So, we will now show you the sample size calculation using this hypothesis testing framework. So, primarily we will be using either β or $1 - \beta$. And we will see that β or $1 - \beta$ is a function of sample size n , and then for a particular β or $1 - \beta$. We what we want to achieve, then what will be the sample size n . So, that that particular β or $1 - \beta$ can be achieved.

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Hypothesis testing framework

$H_0: \mu = \mu_0$
 $H_1: \mu \neq \mu_0$

Let H_0 is false, i.e., $\mu = \mu_0 + \delta$

Then, $E(Z_0) = E\left(\frac{\bar{X} - \mu_0}{\sigma/\sqrt{n}}\right) = \frac{\mu_0 + \delta - \mu_0}{\sigma/\sqrt{n}} = \frac{\delta\sqrt{n}}{\sigma}$

Probability of a Type II Error for the Two-Sided Alternative Hypothesis on the Mean, Variance Known

$$\beta = \Phi\left(z_{\alpha/2} - \frac{\delta\sqrt{n}}{\sigma}\right) - \Phi\left(-z_{\alpha/2} - \frac{\delta\sqrt{n}}{\sigma}\right)$$

$\beta = P\{-t_{\alpha/2, n-1} \leq T_0 \leq t_{\alpha/2, n-1} \text{ when } \delta \neq 0\}$
 $= P\{-t'_{\alpha/2, n-1} \leq T'_0 \leq t'_{\alpha/2, n-1}\}$

When variance is unknown

A graph of β versus δ/σ for a particular sample size is called the **operating characteristic curve**, or **O.C. curve** for the test. The error is also a function of sample size.

So, see the situation here. Situation is if H_0 is true, this is the left-hand side normal distribution, we are assuming z distribution here. So, if H_0 is false, that actually μ is not equal to μ_0 . That means μ is $\mu_0 + \delta$; then this under this condition H_1 is true. So, then the underlying distribution is the right-hand side one.

So, what how do we test? We test calculate that z_0 which is $\bar{x} - \mu_0$ or $\bar{y} - \mu_0$ here we are reading $\bar{x} - \mu_0$ by σ/\sqrt{n} we are considering x is the variables of importance. Or we can write z_0 equal to all through we have written this way μ_0 by σ/\sqrt{n} . So, if $\mu = \mu_0$, then what will be the expected value of z_0 , under null hypothesis. It will be expected value of either $\bar{x} - \mu_0$ by σ/\sqrt{n} . That is what you want to calculate. So, this is nothing but basically expected value of your; if I just do little bit of manipulation, we will get what we are getting $\mu = \mu_0 + \delta$.

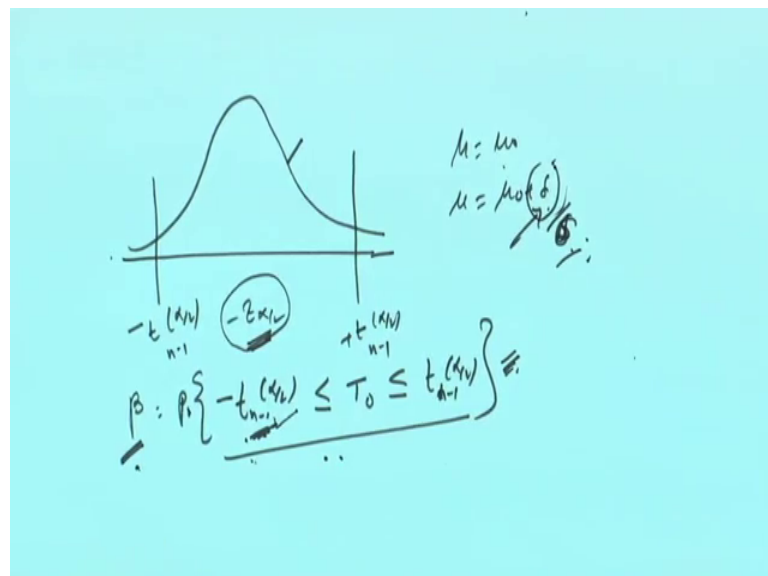
So, $\mu = \mu_0 - \delta$, then then this will ultimately leads to expected value of $\bar{x} - \mu_0 + \delta$ by σ/\sqrt{n} . And then $\bar{x} - \mu_0$ by σ/\sqrt{n} , this this will be 0, that expected value of this will be 0, but expected value of this will be there. That means expected value of δ by σ/\sqrt{n} which is nothing but $\delta\sqrt{n}$ by σ . So, if H_1 is true, then instead of this quantity $\bar{x} - \mu_0$ by σ/\sqrt{n} . Or expected value of $\bar{y} - \mu_0$ by σ/\sqrt{n} which one you take you take y is the random variable or x is random variable depending on this will

not become 0, these become delta by sigma root n. That is what is given here. So, that mean the second distribution is normal distribution with mean sigma s delta root n by sigma and variance is 1.

Then what is the beta? Beta is your; you go back what is beta? Fail to reject H_0 H_0 is false. So, that mean what we are writing this is the distribution under H_0 . So, but h, but H_0 is not true H_0 it is H_1 is true. So, any value falling here what will happen it will be although H_0 is not true, but we will accept it. Then what is the probability that H_0 is not true, but it is accepted is the overlapping portion between these and this; because minus z alpha minus z alpha by 2 plus z alpha that is the reason which is the acceptable reason.

So, the overlapping portion under H_1 true is this sided portion. This you will find out this probability, and then you find out the probability will be like this. This is the equation probability. Now in case that is not your sigma is not known, you will a sample standard deviation, then this quantity $\bar{x} - \mu_0$ by sigma by root n this quantity follows; t distribution and your beta will be calculated using this equation. That beta will be probability minus t alpha by 2 n minus 1 to t alpha by 2 n minus 1, that mean what happened in this case?

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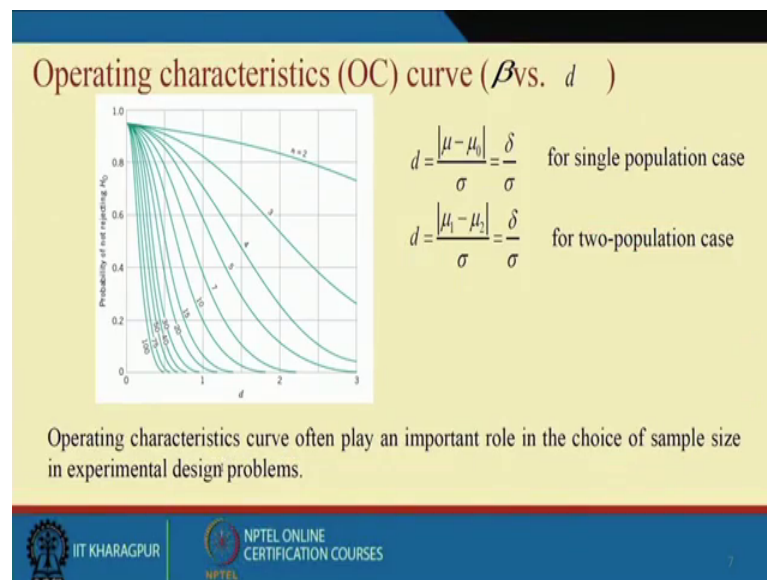


In this case these done several time. So, this will be minus t alpha by 2 n minus 1 and this will be plus t alpha by 2 n minus 1.

So, beta will be your probability that minus t n minus 1 alpha by 2 less than equal to t 0, less than equal to t alpha n minus 1 alpha by 2 this; however, this cannot be because she here what happened n is there, but if when z is there if it z distributed, then will write z alpha by 2 minus z alpha by 2 which is independent of which is divide of n. So, you we require a curve, like earlier I shown you that t distribution time you use a curve; so this kind of curve. So, beta a is dependent on n; so now, beta versus n. So, as such what happened, we find out that from these equations that delta by sigma and beta they are dependents. So, if you plot beta versus delta by sigma for a particular sample size, then this curve is known as operating characteristic curve or OC curve.

And or you can produce B beta versus n also that is also OC curve. So, we will see that 2 curves, one is beta versus delta by sigma. Another one is beta versus n, or we will see 1 minus beta versus n, all are basically operating characteristic curve. The beauty of this curve is that given value of beta, and given a value of for a particular delta, you will be in a position to calculate what should be the sample size. And other way around given delta and sample size what will be the beta? So, those alternatively you can calculate.

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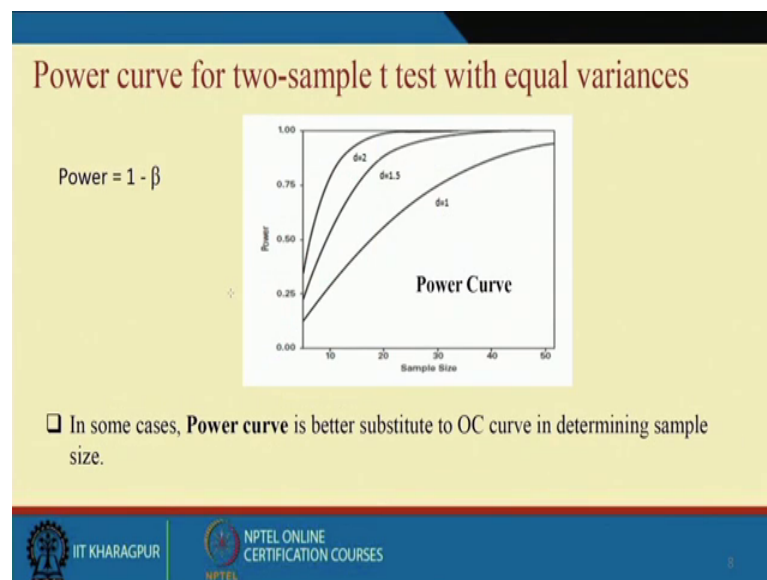


So now let us see that on operating characteristic curve where beta versus d. D is nothing but delta by sigma, which is a basically sigma waited delta. Delta is what? That mu h mu h not m 0 mu is mu 0 plus delta that is the mean shift. What is the shift? In mean that is delta.

So, these when it is divided by it is standard deviation by standard deviation sigma. Then we are creating a quantity called d, now probability of rej not rejecting H 0. When H 0 is false, that is what is your beta versus d you will be getting for different sample size it is like this, the curve is like this. So, you see if your sample size increases, then for a when a small d, you are you are able to reject it. So, ifs because a operating characteristics curve will give you the behavior with reference to beta and d, and also for different kinds of n. So, probability of not rejecting H 0 beta is very high suppose n equal 2, even though d is very large, but then also what happened? The probability of rejecting H 0 probability of not rejecting H 0 is very high beta average very high.

So, if you increase these you find out that the probability of not rejecting H 0 is reducing.

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So, only use this power curve, what is the power curve? Power curve here instead of beta we are using 1 minus beta versus sample size for different value of d different value of d. So, if you know d and you basically fix a beta, then from this curve you know the sample size. And here, suppose if you know beta, and you know d and fix a value of beta, then you or fix a you want to see that the for a particular sample size what will be the beta that is also very impossible suppose I know d equal to 1, my sample size is suppose let it be 7. So, one and sample size 7, what will be the probability of not rejecting H 0, this you project to left hand side it will be like this. This value may be 0.38.

In power curve what happened? We here what we are saying that power is the is 1 minus beta, that mean probability of rejecting H_0 when H_0 is false. Suppose our d value is d value is 1. And then if our we want it to be that 80 percent power should be there or 0.1 minus, the 0.8, then you may find out that it t require around 50 number of observe a n observation to be collected that is what is your sample size. Now what I will do? I will give you one example.

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An example

Two competing medicines (A and B) are analyzed to determine how they affect the mean curing time (y). Each of the medicine A and B were administered to two separate groups of 10 young patients. The following results were obtained:

Group-1: $\bar{y}_1 = 10, s_1 = 1.50, n_1 = 10$ and Group-2: $\bar{y}_2 = 11, s_2 = 2.50, n_2 = 10$

Suppose that Medicine B produces a mean curing time that differs from the mean curing time of Medicine A by 4. If we want to reject H_0 with a probability of at least 0.90, what sample size is required?

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Two competing medicine A and B are analyzed to determine how they affect the mean curing time. Each of the medicine A and B were administered 2 separate group of 10 young patient the following results were obtained.

So, we are we are considering here that the 10 young patient, these 2 groups are similar in all other counts except, they are administered 2 different competing medicines. Suppose, the medicine B produces a mean curing time that differs from the mean curing time of medicine a by 4 unites. And if we want to reject H_0 with a probability of at least 0.90 what is the sample size required? What are the things given? \bar{y}_1 bar s \bar{y}_2 bar and n_1 and y_2 bar s s_2 and n_2 is given. In addition, what is given that the difference each 4 not 0. And in addition, what is given that we want a probability, we want to reject H_0 with a probability of at least 0.90.

So, what is the sample size that is required? We want to know the n whether the $n_1 = 10$ and $n_2 = 10$ is sufficient or not.


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An example (contd.)


Group-1: $\bar{y}_1 = 10, s_1 = 1.50, n_1 = 10$ and Group-2: $\bar{y}_2 = 11, s_2 = 2.50, n_2 = 10$

$$S_p = \sqrt{\frac{(10-1)1.5^2 + (10-1)2.5^2}{10+10-2}} = 2.06$$
$$d = \frac{|\delta|}{\sigma} = \frac{|4|}{2.06} \approx 2.0$$

Now from chart with $d=2$ and $1-\beta=0.90$, $n = 14$.
So, $n_1 = n_2 = 7$.



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So, you first you calculate s_p which is 2.06, then you find out delta. Delta is here almost 2. Now from the chart as beta is 0.90 $1 - \beta$ is 0.90, because quality of reject H_0 and H_0 is false. That is $1 - \beta = 0.90$ or d equal to 2, what value here getting from this? So, $d = 2$ and 0.90 is $1 - \text{power}$ is 0.90. So, if you just what you do if you take this is 0.90. Take a 5 under line here, it meets here, and then draw a particular line it will be somewhere here whose value is around 14.

So, that mean n should be 14. So now, we have 2 different two populations. So, it will be for each population is each sample it will be n by 2; so n_1 equal to n_2 equal to 7. Roughly n by 2 we will give you the accurate results.

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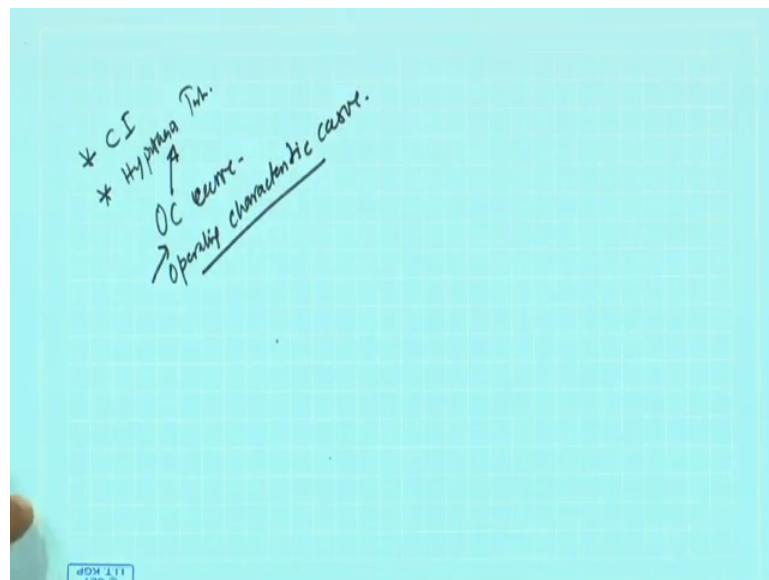
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So, this is what the sample size determination. So, you can use the confidence interval approach or you can use hypothesis testing approach hypothesis testing approach.

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And a in hypothesis testing approach the important concept what you run this OC curve; that is, operating characteristic curve. An OC curve is develop for different combination like it will be beta versus the shift mean shift. Or for given n sample size beta versus that n for if a given shift power versus that mean shift given an power versus your n given mean shift very, very popular concept. I hope you will be when you conduct experiment

you will be in a position to know what should be the appropriate sample size, when you are conducting experiment involving one population or two population cases.

Thank you very much.